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Exposure Classification and Temporal Variability in Urinary Bisphenol-A Concentrations among Couples in Utah— The HOPE Study

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Abstract

Background: Bisphenol-A (BPA) is an endocrine disruptor and potential reproductive toxicant,

but results of epidemiologic studies have been mixed and criticized for inadequate exposure

assessment that often relies on a single measurement.

Objective: Our goal was to describe the distribution of BPA concentrations in serial urinary

specimens, assess temporal variability, and provide estimates of exposure classification when

randomly selected samples are used to predict average exposure.

Methods: We collected and analyzed 2614 urine specimens from 83 Utah couples beginning in

2012. Female participants collected daily first-morning urine specimens during 1-2 menstrual cycles

and male partners collected during the woman's fertile window for each cycle. We measured urinary

BPA concentrations and calculated geometric means (GM) for each cycle, characterized the

distribution of observed values and temporal variability using intraclass correlation coefficients, and

performed surrogate category analyses to determine how well repeat samples could classify

exposure.

Results: The GM urine BPA concentration was 2.78 ng/mL among males and 2.44 ng/mL

among females. BPA had a high degree of variability among both males (ICC=0.18, 95% CI

0.11, 0.26) and females (ICC=0.11, 95% CI 0.08, 0.16). Based on our more stringent surrogate

category analysis, to reach proportions ≥ 0.80 for sensitivity, specificity, and PPV among

females, six and ten repeat samples for the high and low tertiles, respectively, were required. For

the medium tertile, specificity reached 0.87 with 10 repeat samples, but even with 11 samples,

sensitivity and PPV did not exceed 0.36. Five repeat samples, among males, yielded sensitivity

and PPV values ≥ 0.75 for the high and low tertiles, but, similar to females, classification for the

medium tertile was less accurate.

Conclusion: Repeated urinary specimens are required to characterize typical BPA exposure.

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Introduction

Bisphenol-A (BPA) is an endocrine disrupting chemical with nearly ubiquitous,

involuntary exposure, commonly found in polycarbonate plastic, epoxy resins, can food linings,

dental sealants, thermal receipt paper, and other commercial products (Calafat et al. 2005; Kang

et al. 2006; Lakind and Naiman 2011).

BPA has received considerable attention as a potential reproductive toxicant, but results

of epidemiologic studies have been mixed and criticized for the predominance of cross-sectional

study designs and inadequate exposure assessment (Lakind et al. 2014). BPA is short-lived in

the body and is excreted through the urine with a half-life of ~6 hours (Volkel et al. 2002).

Urinary concentrations reflect exposure that occurred during a relatively short period preceding

sample collection, making a spot sample only reflective of long-term exposure if daily exposures

are fairly constant over time. Previous studies have examined temporal variability of urinary

BPA concentrations and found significant within- and between-person variability with low to

moderate reproducibility over time (Arakawa et al. 2004; Braun et al. 2011; Braun et al. 2012;

Christensen et al. 2012; Mahalingaiah et al. 2008; Meeker et al. 2013; Nepomnaschy et al. 2009;

Teitelbaum et al. 2008), as well as significant variation within a day (Ye et al. 2011). Although

spot samples are resource efficient, they are likely to introduce misclassification bias via the

inability to measure transient exposures and exposures that are rapidly excreted. Studies of BPA

exposure and health outcomes have been limited by reliance on a single exposure measurement

as a proxy for an entire developmental stage, such as preconception, the trimesters of pregnancy,

or the postpartum period (Braun et al. 2014; Lee et al. 2014; Perera et al. 2012; Valvi et al.

2013).

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The aim of this study was to assess exposure classification and temporal variability among individuals with repeated first-morning urinary BPA measurements collected over one to two menstrual cycles.

Methods

Participants

This analysis was performed on a subset of participants (83 couples, 166 participants) from an ongoing prospective cohort of heterosexual couples planning pregnancy within three months after enrollment—The Home Observation of Periconceptional Exposures (HOPE) Study. Participants were recruited from the greater Salt Lake City, Utah area beginning in January 2012. Female participants were required to be aged 18–35 and male participants aged 18–40.

The study was approved by the University of Utah Institutional Review Board and participants signed an informed consent document prior to participation. Following consent, participants met with a member of the study staff who explained study procedures, provided biospecimen collection materials, and obtained height and weight measurements.

Urine sample collection

Following our protocol using a previously validated method for identifying ovulation, female participants observed changes in cervical mucus and identified an estimated day of ovulation (EDO) and fertile-window (time when conception is likely to occur) for each menstrual cycle (Porucznik et al. 2014). Male and female participants collected daily firstmorning urine samples (first void upon waking) from the first day of fertile-quality cervical mucus. Males discontinued collecting after the EDO making their total collection window

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approximately seven days and correspond to their female partner's fertile-window. Females continued to collect for the remainder of the menstrual cycle up until the onset of the next menses or until she had a positive pregnancy test which was performed 18 days following the EDO. In cases where first-morning samples were not collected, participants were instructed to collect later in the day and mark the specimen to indicate that it was not first-morning. Using the same collection protocol, both partners collected urine samples for a second cycle if pregnancy was not achieved during the first cycle. Urine was collected in four ounce polypropylene specimen cups then transferred to 50 mL polypropylene tubes that were placed in the participants' home freezer until the end of the menstrual cycle. At the end of each cycle, a member of the study staff collected the samples from the participants and transported them to the Center for Human Toxicology at the University of Utah for analysis.

Urinary BPA measurements

Urine samples were stored at -20°C upon arrival at the lab and again after processing. Total BPA (unconjugated BPA plus mono-glucuronide conjugate and mono-sulfate conjugate) was measured in the urine samples using ultra-high-performance liquid chromatography-tandem mass spectrometry. Analytical chemistry methods and quality control procedures have previously been described (Anderson et al. 2014). Briefly, the method utilized liquid/liquid extraction with 1-chlorobutane and a human urine aliquot size of 800 µL. Chromatography was performed on an Acquity UPLC® system with a Kinetex® Phenyl-Hexyl column. Mass spectrometric analysis was performed with negative electrospray ionization on a Quattro Premier XE^{TM} . Acceptance criteria for analytical standards and quality controls were $\pm 20\%$ of nominal concentration. The limit of detection (LOD) was 0.1 ng/mL and the limit of quantification (LOQ) was 0.75 ng/mL. All samples from members of the same couple (per cycle) were analyzed

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concurrently during the same analytical batch. To prevent contamination, laboratory glassware, consumables, and reagent chemicals were verified not to be sources of BPA via laboratory assay prior to use. Biospecimen collection materials were made of polypropylene, according to manufacturer specifications, which is not expected to be a source of BPA.

Statistical analysis

Analysis was performed using SAS software (version 9.3; SAS Institute Inc., Cary, NC). A total of 296 (11.3%) values were below the LOQ and were assigned a value of LOO/ $\sqrt{2}$, or 0.53 ng/mL (Hornung and Reed 1990). Because the number of urine samples from each participant varied and within-person concentrations were log-normally distributed, geometric means (GM) with 95% confidence intervals (CI) are presented.

These data are uncorrected for urinary dilution. The type of correction used to adjust for urinary dilution in BPA literature is inconsistent. It is common to see adjustment for specific gravity, urinary creatinine or osmolality. However, Lassen et al. (2013) report that no methods used to adjust for urinary dilution (osmolality, volume, creatinine) altered the consistency of repeated measures among comparison of two spot, three first morning, and three 24-h urine samples collected over a three month time period, although these samples were collected from 33 Danish males and their study did not include females. A sensitivity analysis performed on a subset of HOPE specimens (453 samples from females, 42 samples from males) found that correction for urinary dilution of predominantly first-morning samples, using both specific gravity and urinary creatinine, did not appreciably alter the concentrations (mean 19% relative change) and did not change relative tertile categorization into tertiles of exposure for each participant (data not shown). Given that tertile categorization in surrogate category analysis and

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analysis of repeated measures is the primary focus of this paper and we have repeated firstmorning samples, we elected not to correct for urinary dilution in these analyses.

Given that BPA exposure primarily occurs via ingestion of food, observations from members of the same couple that share a common household diet cannot be considered independent (Mahalingaiah et al. 2008). Additionally, multiple observations from the same individual cannot be considered independent. To account for these factors, clustering at the individual and male-female partner levels was used when calculating geometric means for the cohort using SAS PROC SURVEYMEANS.

Intraclass correlation coefficient analysis

To quantitatively assess between- and within-subject variability of urinary BPA concentrations, intraclass correlation coefficients (ICCs) and their 95% confidence intervals (CIs) were calculated using mixed random effects models that accounted for clustering at the male-female partner level and for multiple cycles, when appropriate, in SAS PROC MIXED (Hankinson et al. 1995; Rosner 2010). ICC is a measure of the reliability of repeated measures over time, defined as the ratio of the between-subject variance and total variance (sum of between-subject variance and within-subject variance). ICC ranges from zero to one, with values near zero indicating poor reliability and a greater degree of variation within-subjects, and values near one indicating high reliability and a greater degree of variation between-subjects (Rosner 2010).

Exposure classification analysis

Although the ICC is an indicator of reliability for continuous values, it does not measure the extent of exposure misclassification that may occur if exposure is categorized, for example

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into tertiles of low, medium, and high exposure. To address this and examine how the number of samples collected may improve categorization, we performed surrogate category analyses (Braun et al. 2012; Hauser et al. 2004; Mahalingaiah et al. 2008; Meeker et al. 2012). We began by calculating the GM across all the samples collected for each participant separating each cycle/month, where applicable, and considered this the "true" or most accurate assessment of the individual's mean exposure. We then classified the "true" GM into a low, medium, or high tertile of exposure. Among participants that collected samples for more than one cycle, a separate GM and tertile was calculated for each cycle. Tertiles were created separately for males and females based on the sex-specific distribution of BPA geometric means of all samples, and males and females were analyzed separately in this analysis. Participants were then classified into "predicted" or surrogate tertiles based on the concentration of a subset of randomly selected samples from their corresponding cycle-specific pool of total samples.

To assess how adding additional samples improved categorization, we sequentially added samples to the surrogate GM then categorized that into a surrogate tertile. The procedure was repeated, adding one more specimen each time until n-1 was reached for the available specimens for that individual and cycle—performing this procedure separately for each cycle that the participant collected specimens. Geometric means of all possible combinations of sample pairings in each of these levels and for each participant/cycle were used when calculating the "surrogate" value. The surrogate tertile was then compared to the "true" tertile in a contingency table. Values from individual contingency tables were combined into a single table and overall sensitivity, specificity, and positive predictive value (PPV) were calculated and weighted by the effective sample size (the number of possible combinations per person multiplied by the number of individuals in each stratum). The goal of this analysis was to simulate and compare the ability

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of exposure assessment that involves a single sample, or set of repeated samples, to predict a female's "true" exposure over a single menstrual cycle and a male's exposure over a single fertile-window. This version of the surrogate category analysis, which will hereafter be referred to as Analysis 1, is similar to previous studies (Braun et al. 2012; Hauser et al. 2004; Mahalingaiah et al. 2008).

The surrogate category analysis was repeated with slightly different methods. In the second version, hereafter referred to as Analysis 2, the samples used to calculate the surrogate GM were not used in the calculation of the "true" GM. This eliminates the structural dependency that inherently exists between the surrogate GM and the "true" GM when the samples used in the surrogate GM are also included in the "true" GM (Braun et al. 2012; Mahalingaiah et al. 2008). However, once greater than half the sample values are used in the calculation of the surrogate GM (and the remaining values are used to calculate the "true" GM), the values obtained for sensitivity, specificity, and PPV are reciprocal complements to the values already obtained, and thus, were not included in the final calculations. For example, if a person had a total of 20 samples and one was used to calculate the surrogate GM, the remaining 19 would be used to calculate the "true" GM. As incrementing to n-1 continued, eventually the surrogate GM would include 19 specimens leaving only 1 to be used in the calculation of the "true" GM. This calculation would produce reciprocal values complementary to those obtained in the previous 19 versus 1 calculation. Therefore, surrogate values for this approach were only done for up to n/2 samples for any individual. Note that in instances where no surrogate values fell into a particular "true" tertile, sensitivity and PPV could not be calculated for that tertile, so the total number of observations contributing to each final mean differed. We used this method to avoid the problem of over-inflation of the sensitivity, specificity, and PPV that occurs due to the non-independence

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of the surrogate and "true" measures with Analysis 1 (Braun et al. 2012; Mahalingaiah et al.

2008).

Results

The mean age of female participants was 26.8 ± 3.8 years and the mean for male participants was 28.3 ± 4.0 years (Table 1). The majority of participants (144, 86.7%) were Caucasian and only 6 (3.6%) were Hispanic, with mean body mass index (BMI) of 25.3 ± 5.3 kg/m². This population was highly educated with 60.8% (101) college graduates and 36.1% (60) with some college education (1–3 years). Most participants were never smokers (149, 89.8%).

Urinary BPA concentrations were measured in 2632 urine samples collected from 166 participants (83 male, 83 female). Of the 2632 urine samples, 18 were excluded due to inadequate labeling leaving 2614 samples for analysis (Table 2). The majority (n=2498, 95.6%) of samples were first-morning samples and the remaining 116 (4.4%) were spot samples collected later in the day when the participant forgot to collect upon waking.

Among the 2614 urine samples, 1996 were collected by females and 618 were collected by males (Table 2). On average, females collected 17±5 samples per person/cycle (range 1 to 24) and males collected during the female partner's fertile window with an average of 6±2 samples per person/cycle (range 1 to 12). Among females, 49 (59%) collected samples for two menstrual cycles and 47 (56.6%) males collected during the fertile-window for two partner menstrual cycles (two men failed to collect samples when their partner was collecting). Twenty-four couples became pregnant during the first cycle of sample collection and ten couples became pregnant during the second cycle of sample collection. The median BPA concentration was 2.40 ng/mL among all individual samples with a range from <LOQ to 160.0 ng/mL. The GM for the

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entire cohort was 2.52 ng/mL (95% CI 2.27, 2.79). Males had slightly higher median values (2.64 ng/mL) compared to females (2.33 ng/mL) as well as a higher GM (males=2.78 ng/mL). 95% CI 2.39, 3.22, females=2.44 ng/mL, 95% CI 2.15, 2.77). The ICC for all samples was 0.15 (95% CI 0.11, 0.19) indicating high within-person variation. Males had a slightly higher ICC (0.18, 95% CI 0.11, 0.26) compared to the overall and compared to females (0.11, 95% CI 0.08, 0.16). Limiting the calculation of ICC to first-morning samples and to individual cycles did not substantially change these results.

Exposure Classification Analysis

Female, Analysis 1

Statistics (sensitivity, specificity, and PPV) summarizing the ability of repeat samples to correctly predict a participant's "true" exposure classification are shown in Figure 1 (see Supplemental Material, Table S1 for corresponding numeric data). Exposure tertiles for females were defined as follows based on the distribution among all female samples: low (<1.76 ng/mL), medium (≥ 1.76 ng/mL-< 3.33 ng/mL), high (≥ 3.33 ng/mL). The median proportion of females who "truly" were in the highest exposure tertile and were classified as such based on one randomly selected sample (i.e., sensitivity) was 0.59 (IQR 0.53, 0.71) but increased with additional samples and reached 0.80 (IOR 0.78, 0.95) when at least five samples were included. Similarly, five repeat samples were required to reach a median sensitivity of 0.80 (IOR 0.73, 0.99) for females within the lowest tertile of exposure. Sensitivity to correctly categorize females in the medium tertile was quite a bit lower compared to the high and low tertiles, with median sensitivity of only 0.35 (IOR 0.27, 0.42) and 0.54 (IOR 0.49, 0.59) for one and five samples, respectively, and 13 samples required to reach 80% sensitivity.

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Five repeat samples were required for females within the high tertile of BPA exposure to exceed a proportion of 0.80 correctly classified into the high tertile when they belonged in that tertile based on the GM of their samples from a given cycle (i.e., PPV) (PPV= 0.88, IOR 0.55, 0.97). When only a single sample was used to classify in the high tertile, PPV was 0.52 (IQR 0.29, 0.78). Classification for females truly in the low tertile was similar and required five repeat samples to reach a PPV of 0.87 (IQR 0.63, 0.91).

Specificity, the proportion of participants that were not classified into a tertile when they were "truly" not in that tertile was higher than sensitivity and PPV, and only three samples were required to reach or exceed a proportion of 0.80 for specificity in the high and low tertiles, but five were required for the medium tertile...

Female, Analysis 2

When the repeat samples used in the surrogate tertile were not used in the calculation of the "true" GM, the sensitivity, specificity, and PPV dropped compared to Analysis 1 (Figure 2, corresponding numeric data in Supplemental Material, Table S2). When only one sample was used, the sensitivity in all three exposure tertiles had medians less than 0.60 (Low 0.57, Medium, 0.36, High 0.55). Six repeat samples was sufficient to exceed a median proportion of 0.80 for both sensitivity and PPV in the high exposure tertile. Specificity remained much the same as Analysis 1 and three samples correctly classified both the low and high tertiles with a median proportion exceeding 0.80. Even with 11 repeat samples, median sensitivity and PPV in the medium tertile was <0.36. This is likely due to participants having samples with a mixture of both high and low BPA concentrations that make categorization less consistent for the medium tertile, although specificity is 0.88 (95% CI 0.88, 0.94) with 11 samples.

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Male, Analysis 1

tertiles for males were defined as follows: low (<2.20 ng/mL), medium (≥2.20 ng/mL-<4.15 ng/mL), high (≥4.15 ng/mL). Four repeat samples were sufficient for males to reach a median sensitivity of 0.80 in the high tertile (0.80, IQR 0.80, 0.90), and two samples were needed to exceed 0.80 for the low tertile (0.83, IQR 0.79, 0.85) (Figure 3, corresponding numeric data in Supplemental Material, Table S3). Three repeat samples generated a median PPV for the high tertile of 0.86 (IOR 0.83, 0.88) and 0.73 (IOR 0.44, 0.76) for the low tertile. Similar to the

As described earlier, fewer samples were available from males for analysis. Exposure

patterns seen in females, males had higher and more precise values for specificity with only one

to two samples required to exceed a median proportion of 0.80 in each of the three tertiles of

exposure, and multiple samples were less accurate for classifying sensitivity and PPV in the

medium tertile.

Male, Analysis 2

When a single sample was used to predict the high exposure tertile, the median sensitivity

and PPV were 0.56 (IQR 0.42, 0.63) and 0.39 (IQR 0.33, 0.58), respectively (Figure 4,

corresponding numeric data in Supplemental Material, Table S4). These both increased with

additional samples and reached a maximum of 0.75 with five repeat samples. The median

sensitivity with a single sample to predict the low exposure tertile was 0.57 (IQR 0.53, 0.71) and

this increased to 0.95 (IQR 0.95, 0.96) when five repeat samples were used. The PPV for the low

tertile with five repeat samples was similar (PPV=0.98, IQR 0.92, 0.98).

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Discussion

The urinary BPA GM concentrations among HOPE study females was higher than that reported in other studies which have reported unadjusted or specific gravity adjusted geometric means <2.0 µg/L among pregnant women with one to five samples per woman in Canada (Fisher et al. 2015), the Netherlands (Jusko et al. 2014), New York (Perera et al. 2012), Mexico City (Cantonwine et al. 2010), California (Harley et al. 2013), and in the National Children's Study (Mortensen et al. 2014). The median concentration among HOPE females (2.33 ng/mL) is similar to other unadjusted or specific gravity adjusted medians with one to five samples per woman reported in Boston (Braun et al. 2012; Mahalingaiah et al. 2008), Puerto Rico (Meeker et al. 2013), France (Philippat et al. 2012), and Spain (Casas et al. 2011). In part, differences in concentrations may be because most HOPE samples were collected first-morning which has been shown to yield higher BPA concentrations compared to spot and 24-h collection (Christensen et al. 2012). This may also be due in part to the fact that females in the HOPE study collected a mean 17±5 samples per cycle compared to other studies with a single spot sample or set of three to five spot samples per female, usually collected over the trimesters of pregnancy and postpartum. When comparing HOPE study results (where some women became pregnant during specimen collection but some did not) with studies of pregnant women, it is important to note that pregnancy status is likely to influence exposure patterns and physiology, and may affect urinary concentrations and variability, making direct comparison of pregnant and non-pregnant women warrant caution.

Among HOPE participant males, concentrations were also higher compared to other studies reporting unadjusted geometric means or medians <2.0 µg/L in Michigan and Texas (Goldstone et al. 2014), California (Mendiola et al. 2010), Boston (Mahalingaiah et al. 2008),

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and Denmark (Lassen et al. 2014), although another study among 308 Danish men reports an

unadjusted median concentration of 3.25 ng/mL (Lassen et al. 2013).

We observed high within-person variability relative to total variability of serial urinary BPA samples over one to two menstrual cycles with an ICC of 0.11 among females and 0.18 among males. Among females, this is consistent or lower compared with findings from 389 pregnant women in Ohio with three spot samples collected during pregnancy (ICC=0.10-0.12 creatinine adjusted, ICC=0.25-0.28 unadjusted) (Braun et al. 2011), female nurses in fourteen states with two first morning samples collected one to three years apart (ICC=0.14) (Townsend et al. 2013), 105 women in Puerto Rico with three samples collected during pregnancy (ICC=0.24-0.27) (Meeker et al. 2013), 137 women in Boston with two specimens collected prior to pregnancy and three collected during pregnancy (ICC=0.23 pre-pregnancy, ICC=0.12 during pregnancy) (Braun et al. 2012), and among women trying to conceive with three repeat samples in a single menstrual cycle in North Carolina (ICC=0.43) (Nepomnaschy et al. 2009). Our ICC was slightly higher than that observed by Fisher et al. (2015) (ICC=0.07) who measured at five time points across pregnancy and postpartum. Among this analytical subset of HOPE couples, 34 became pregnant during specimen collection (24 in Cycle 1 and 10 in Cycle 2). Within a single cycle for women who conceived, the first few specimens were collected when she was not pregnant but the remainder of the cycle's samples were collected when she was pregnant. The exact number of pregnant versus non-pregnant days for each cycle cannot be calculated without knowing when implantation occurred, but this change in the woman's physiology could be a source of additional within-person variability during a given cycle. Lassen et al. (2013) examined reproducibility over a three month period in spot, first-morning, and 24-h urine samples among males and found unadjusted ICC values of 0.42, 0.10, and 0.26, respectively.

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Our observed ICC for first-morning samples among males is similar but slightly higher (ICC=0.18).

The sensitivity of a single sample, among females, to predict the high exposure tertile observed in this study (Analysis 1, 0.59, IQR 0.53, 0.71) was slightly lower than that observed by both Braun et al. (2012) (0.600.70) and Mahalingaiah et al. (2008) (0.64), whose methods were similar to those used in Analysis 1 of our surrogate category analysis (Table 3). PPV and specificity were similarly low compared to Braun et al. (2012) and Mahalingaiah et al. (2008). Fisher et al. (2015) also performed a surrogate category analysis that excluded the surrogate sample from the "true" GM (similar to Analysis 2 with slightly different methods) and observed sensitivity and PPV for a single sample that was higher (0.61-0.65) than observed in Analysis 2 of this study among females, although their analysis was based on different sample collection methods with fewer samples per person (two 24-h samples and three spot samples), and all participants were pregnant. We consider the Analysis 2 analysis among females to be the most precise in this study for two reasons, namely, the high number of samples per person lends itself to a more accurate characterization of typical exposure, and the removal of the inherent structural dependency through analytic methods. We believe that sensitivity, specificity and PPV were overinflated when the sample used to calculate the surrogate GM was also used to calculate the overall GM, given that results for Analysis 2 of the surrogate category analysis were generally lower compared to Analysis 1. Males consistently required fewer repeat samples for correct categorization compared to females, but this is likely due to the fact that we had fewer total samples for analysis for males compared to females and samples were collected over a shorter period of time, which could contribute to less variation.

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One strength of this study is the high number of samples per person relative to previous studies, which may result in a more accurate categorization of the individual's "true" exposure assuming that a GM of a higher number of repeated samples is a more accurate assessment of the individual's level of exposure over time. The predominance of highly concentrated first-morning samples and high compliance with sample collection also strengthens the exposure assessment in this study. This study is also unique in that it considers both males and females separately as it has been observed that males and females have different patterns of exposure with regards to BPA, and BPA may exert potential effects differently between males and females (Lakind et al. 2014). However, our ability to draw conclusions about differences between males and females is limited by differences in the number of samples and sampling duration.

Although this study only predicts one cycle of exposure at a time, BPA concentrations between cycles were correlated (Spearman Correlation ρ =0.67, p<.001 for females, ρ =0.64, p<.001 for males). This moderate correlation is higher than that observed in samples collected among pregnant women (Braun et al. 2011; Braun et al. 2012; Fisher et al. 2015; Jusko et al. 2014), although these studies collected single spot samples spread over weeks to months. It is possible that we observe higher correlation because we have more samples per person and time between sample collections were reduced. Nepomnaschy et al. (2009) also observed moderate Spearman correlations of ρ =0.53 and ρ =0.56 with samples collected 14 days apart and ρ =0.30 for the total time separation of 28 days among women trying to conceive. We believe the combination of the accurate assessment of daily exposure from repeated sampling in this study with the fact that cycles are correlated allows us to conclude that the assigned tertile categorization would be consistent over time and reflect the individual's likely habitual and longterm exposure.

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Generalizability of our study may be limited by the proportion of highly-educated, high-income Caucasian individuals in the cohort. These characteristics can affect measured urinary concentrations of BPA through differences in exposures related to diet, employment, or other socioeconomic factors (Calafat et al. 2008). This group of participants was also highly motivated and collected specimens with high compliance to the study protocol, thus, this urine collection protocol may not be possible in other populations that are less motivated, and it may not be reasonable to expect such a high number of samples per person in other studies.

Previous studies have also reported that time of day, fasting time, and time since last void may affect urinary BPA concentrations (Braun et al. 2011; Fisher et al. 2015; Mahalingaiah et al. 2008; Ye et al. 2011), but Stahlhut et al. (2009) did not find a strong association between fasting time and BPA. Therefore, it may be a limitation that daily exposure, fasting time, time of sample collection, and time since previous void are not available in our data and could not be examined in our analyses. It may also be a limitation that exposure classification was performed on firstmorning voids that could be inherently different from other voids throughout the day and 24-h samples. First-morning voids are likely to be reflective of exposure that occurred during dinner the night before but may not accurately reflect exposure that took place during the earlier hours of the day. However, Christensen et al. (2012) found that the distributions of 24-h and subsequent first-morning voids from the same individual were similar (Cramer-von Mises criterion values 0.0002 and 0.002, respectively) with similar variance (Levene's P-values 0.02 and 0.003, respectively), and Lassen et al. (2013) found that 24-h and subsequent first-morning were moderately correlated (Spearman p=0.56, p<.001), although Ye et al. (2011) concluded that first-morning voids were not a good surrogate for 24-h samples. In future studies one could

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compare the classification with repeat samples such as we have done here with 24-h samples from the same individual.

Conclusion

Urinary BPA concentrations have a high degree of variability both within- and betweenindividuals. Evidence from this and other studies suggests that characterization of BPA exposure through a single, or even two repeat samples, may result in substantial misclassification and subsequent attenuation of effect estimates. When considering study design and sampling strategy, the purpose of the assessment must be considered. If long-term characterization of exposure is desired, repeated sampling is required, but in cases where repeat sampling is not feasible or fewer samples are collected, our results may be used by the researcher to estimate the predictive power of the number of collected samples. Based on our more stringent surrogate category Analysis 2, to reach proportions ≥0.80 for sensitivity, specificity, and PPV among females, six and ten repeat samples for the high and low tertiles, respectively, were required. For the medium tertile, specificity reached 0.87 with 10 repeat samples, but even with 11 samples, sensitivity and PPV did not exceed 0.36. Five repeat samples, among males, yielded sensitivity and PPV values >0.75 for the high and low tertiles, but, similar to females, classification for the medium tertile was less accurate. Our results suggest that individuals that would typically be classified into the medium tertile of exposure likely have combinations of high and low exposures that make classification into tertiles without repeated sampling, analyses of temporal variability, and analyses of exposure classification more complicated and less accurate. These results are based on daily, repeat sampling of first-morning urine that is uncorrected for urinary dilution, in a menstrual cycle (female) and a fertile-window (male). Spot samples or samples collected over a greater period of time may be more variable.

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Table 1. Characteristics of study participants

All subjects (n=166)	Male (n=83)	Female (n=83)
		mean±SD, or n(%)
		26.8±3.8
		27 (32.5)
		56 (67.5)
		0
		24.4 ± 4.9
	0	4 (4.8)
88 (53.0)	37 (44.6)	51 (61.5)
45 (27.1)	30 (36.1)	15 (18.1)
28 (16.9)	15 (18.1)	13 (15.7)
1 (0.6)	1 (1.2)	0
144 (86.7)	71 (85.5)	73 (88.0)
20 (12.0)	11 (13.3)	10 (12.0)
1 (0.6)	1 (1.2)	0
6 (3.6)	1 (1.2)	5 (6.0)
159 (95.8)	81 (97.6)	78 (94.0)
1 (0.6)	1 (1.2)	0
22 (13.3)	-	-
54 (32.5)	-	-
	-	-
	-	-
	-	-
	-	-
, ,		
99 (59.6)	46 (55.4)	53 (63.8)
		6 (7.2)
		10 (12.1)
		13 (15.7)
		1 (1.2)
		`o
()	,	-
4 (2.4)	3 (3.6)	1 (1.2)
		27 (32.5)
		55 (66.3)
		0
_ (3.0)	- ()	ŭ
149 (89.8)	70 (84.3)	79 (95.2)
		3 (3.6)
		1 (1.2)
2 (1.2)	2 (2.4)	0
	mean±SD, or n(%) 27.5 ± 4.0 42 (25.3) 120 (72.3) 4 (2.4) 25.3 ± 5.3 4 (2.4) 88 (53.0) 45 (27.1) 28 (16.9) 1 (0.6) 144 (86.7) 20 (12.0) 1 (0.6) 6 (3.6) 159 (95.8) 1 (0.6) 22 (13.3) 54 (32.5) 61 (36.8) 15 (9.0) 10 (6.0) 4 (2.4) 99 (59.6) 10 (6.0) 44 (26.5) 2 (1.2) 1 (0.6) 4 (2.4) 60 (36.1) 101 (60.8) 1 (0.6) 149 (89.8) 10 (6.0) 5 (3.0)	mean±SD, or n(%) mean±SD, or n(%) 27.5 ± 4.0 28.3±4.0 42 (25.3) 15 (18.1) 120 (72.3) 64 (77.1) 4 (2.4) 4 (4.8) 25.3 ± 5.3 26.1 ± 4.7 4 (2.4) 0 88 (53.0) 37 (44.6) 45 (27.1) 30 (36.1) 28 (16.9) 15 (18.1) 1 (0.6) 1 (1.2) 144 (86.7) 71 (85.5) 20 (12.0) 11 (13.3) 1 (0.6) 1 (1.2) 6 (3.6) 1 (1.2) 6 (3.6) 1 (1.2) 6 (3.6) 1 (1.2) 20 (12.0) 11 (13.3) 1 (0.6) 1 (1.2) 25 (13.3) - 4 (3.6) 1 (1.2) 22 (13.3) - 54 (32.5) - 61 (36.8) - 15 (9.0) - 10 (6.0) 4 (4.8) 10 (6.0) 4 (4.8) 10 (6.0) 4 (4.8) 10 (6.0) 1 (1.2)

Abbreviations: SD (standard deviation), BMI (body mass index), GED (General Equivalency Diploma)

^aAge in years

^bBody Mass Index: weight (kg)/height (m)² (measured at enrollment)

^cIncludes Asian, Black/African American, Pacific Islander, American Indian/Alaskan Native ^dUS Dollars, combined household income for both partners

^eIncludes out of work, retired, unable to work

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Table 2. Distribution of urinary BPA concentrations (ng/mL) and intraclass correlation coefficients among 83 males and 83 females

				Percentiles				Geometric Mean	ICC		
Sample type	n	n>LOQ (%)	Minimum	5 th	25 th	50 th	75 th	95 th	Maximum	(95%CI)	(95% CI)
All subjects	2614	2318 (88.7)	<loq< td=""><td><loq< td=""><td>1.27</td><td>2.40</td><td>4.59</td><td>14.8</td><td>160</td><td>2.52 (2.27, 2.79)</td><td>0.15 (0.11, 0.19)</td></loq<></td></loq<>	<loq< td=""><td>1.27</td><td>2.40</td><td>4.59</td><td>14.8</td><td>160</td><td>2.52 (2.27, 2.79)</td><td>0.15 (0.11, 0.19)</td></loq<>	1.27	2.40	4.59	14.8	160	2.52 (2.27, 2.79)	0.15 (0.11, 0.19)
Male	618	558 (90.3)	<loq< td=""><td><loq< td=""><td>1.43</td><td>2.64</td><td>4.94</td><td>17.5</td><td>92.9</td><td>2.78 (2.39, 3.22)</td><td>0.18 (0.11, 0.26)</td></loq<></td></loq<>	<loq< td=""><td>1.43</td><td>2.64</td><td>4.94</td><td>17.5</td><td>92.9</td><td>2.78 (2.39, 3.22)</td><td>0.18 (0.11, 0.26)</td></loq<>	1.43	2.64	4.94	17.5	92.9	2.78 (2.39, 3.22)	0.18 (0.11, 0.26)
Female	1996	1760 (88.2)	<loq< td=""><td><loq< td=""><td>1.22</td><td>2.33</td><td>4.44</td><td>14.2</td><td>160</td><td>2.44 (2.15, 2.77)</td><td>0.11 (0.08, 0.16)</td></loq<></td></loq<>	<loq< td=""><td>1.22</td><td>2.33</td><td>4.44</td><td>14.2</td><td>160</td><td>2.44 (2.15, 2.77)</td><td>0.11 (0.08, 0.16)</td></loq<>	1.22	2.33	4.44	14.2	160	2.44 (2.15, 2.77)	0.11 (0.08, 0.16)
First-morning urine	2498	2218 (88.8)	<loq< td=""><td><loq< td=""><td>1.28</td><td>2.40</td><td>4.61</td><td>15.1</td><td>160</td><td>2.53 (2.28, 2.81)</td><td>0.15 (0.11, 0.20)</td></loq<></td></loq<>	<loq< td=""><td>1.28</td><td>2.40</td><td>4.61</td><td>15.1</td><td>160</td><td>2.53 (2.28, 2.81)</td><td>0.15 (0.11, 0.20)</td></loq<>	1.28	2.40	4.61	15.1	160	2.53 (2.28, 2.81)	0.15 (0.11, 0.20)
Male	574	520 (90.6)	<loq< td=""><td><loq< td=""><td>1.44</td><td>2.65</td><td>5.10</td><td>17.7</td><td>92.9</td><td>2.81 (2.41, 3.29)</td><td>0.18 (0.11, 0.26)</td></loq<></td></loq<>	<loq< td=""><td>1.44</td><td>2.65</td><td>5.10</td><td>17.7</td><td>92.9</td><td>2.81 (2.41, 3.29)</td><td>0.18 (0.11, 0.26)</td></loq<>	1.44	2.65	5.10	17.7	92.9	2.81 (2.41, 3.29)	0.18 (0.11, 0.26)
Female	1924	1698 (88.3)	<loq< td=""><td><loq< td=""><td>1.24</td><td>2.36</td><td>4.48</td><td>14.2</td><td>160</td><td>2.45 (2.15, 2.78)</td><td>0.11 (0.08, 0.16)</td></loq<></td></loq<>	<loq< td=""><td>1.24</td><td>2.36</td><td>4.48</td><td>14.2</td><td>160</td><td>2.45 (2.15, 2.78)</td><td>0.11 (0.08, 0.16)</td></loq<>	1.24	2.36	4.48	14.2	160	2.45 (2.15, 2.78)	0.11 (0.08, 0.16)
Spot urine	116	100 (86.2)	<loq< td=""><td><loq< td=""><td>1.04</td><td>2.17</td><td>4.40</td><td>13.8</td><td>47.2</td><td>2.27 (1.86, 2.78)</td><td>-</td></loq<></td></loq<>	<loq< td=""><td>1.04</td><td>2.17</td><td>4.40</td><td>13.8</td><td>47.2</td><td>2.27 (1.86, 2.78)</td><td>-</td></loq<>	1.04	2.17	4.40	13.8	47.2	2.27 (1.86, 2.78)	-
Male	44	38 (86.4)	<loq< td=""><td><loq< td=""><td>1.25</td><td>2.53</td><td>4.37</td><td>9.02</td><td>20.4</td><td>2.32 (1.69, 3.18)</td><td>-</td></loq<></td></loq<>	<loq< td=""><td>1.25</td><td>2.53</td><td>4.37</td><td>9.02</td><td>20.4</td><td>2.32 (1.69, 3.18)</td><td>-</td></loq<>	1.25	2.53	4.37	9.02	20.4	2.32 (1.69, 3.18)	-
Female	72	62 (86.1)	<loq< td=""><td><loq< td=""><td>1.04</td><td>1.93</td><td>4.40</td><td>22.3</td><td>47.2</td><td>2.25 (1.73, 2.93)</td><td></td></loq<></td></loq<>	<loq< td=""><td>1.04</td><td>1.93</td><td>4.40</td><td>22.3</td><td>47.2</td><td>2.25 (1.73, 2.93)</td><td></td></loq<>	1.04	1.93	4.40	22.3	47.2	2.25 (1.73, 2.93)	

Abbreviations: LOQ limit of quantification, CI confidence interval, ICC intraclass correlation coefficient The LOQ was 0.75 ng/mL and values <LOQ were replaced with LOQ/ $\sqrt{2}$ or 0.53 ng/mL

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Table 3. Surrogate category analysis study comparison table

		BPA exposure	N			
Study	Study population	characterization	samples ^a	Sensitivity	Specificity	PPV
HOPE Study,		Serial daily first-				
Analysis 1 ^{bc}	83 women (subset of	morning collection	1	0.59	0.76	0.52
	HOPE Study)	during pre/conception	2	0.65	0.79	0.59
		cycles				
HOPE Study,	Same as above	Same as above	1	0.55	0.74	0.45
Analysis 2 ^{bd}			2	0.61	0.78	0.45
Braun et al. 2012	91 women from subset of EARTH Study	3 or more spot samples collected from preconception to delivery	1	1 st trimester-0.70 2 nd trimester-0.60 3 rd trimester-0.67	1 st trimester-0.85 2 nd trimester-0.80 3 rd trimester-0.84	1 st trimester-0.70 2 nd trimester-0.60 3 rd trimester-0.67
Mahalingaiah et al. 2008 ^e	Couples seeking infertility treatment in Boston	149 samples from 31 subjects with at least 3 repeat samples ^f	1	0.64	0.76	0.63
Mahalingaiah et al. 2008 ^e	Same as above	67 samples from 8 subjects with at least six repeat samples f	2	0.67	0.84	0.85
Fisher et al. 2015 ^g	80 pregnant women (P4 Study)	5 repeat samples from early pregnancy to delivery Desiring Prediction Value	1	0.65	0.66	0.61

Abbreviations: BPA Bisphenol-A, PPV Positive Predictive Value

^aNumber of samples used to calculate predictive statistics (sensitivity, specificity, and PPV)

^bResults for 1 and 2 repeat samples to predict high tertile among females presented for comparison

^cMethods most directly comparable to Braun et al. and Mahalingaiah et al.

^dMethods most directly comparable to Fisher et al.

^eMen and women included in analyses together

^fSpot samples collected at recruitment, at clinic visits during treatment, and during post-treatment clinical appointments. Women also collected samples during the trimesters of pregnancy.

^gStatistics calculated with slightly different methods

^hTwo samples were 24-h collected prior to 20 weeks gestation and three were spot samples collected during the second and third trimesters then 2-3 months postpartum

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Figure Legends

Figure 1. Surrogate Category Analysis among Females, Analysis 1. The displayed values are the minimum (bottom whisker), 25^{th} percentile (bottom of box), median (line in box), mean (diamond), 75^{th} percentile (top of box), and maximum (top whisker). The horizontal line at 0.8 is a reference line. The x axis represents the number of repeated samples. Tertiles were defined as follows: low (<1.76 ng/mL), medium (\ge 1.76 ng/mL-<3.33 ng/mL), high (\ge 3.33 ng/mL). Corresponding numeric data in Supplemental Material, Table S1.

Figure 2. Surrogate Category Analysis among Females, Analysis 2. The displayed values are the minimum (bottom whisker), 25^{th} percentile (bottom of box), median (line in box), mean (diamond), 75^{th} percentile (top of box), and maximum (top whisker). The horizontal line at 0.8 is a reference line. The x axis represents the number of repeated samples. Tertiles were defined as follows: low (<1.76 ng/mL), medium (≥1.76 ng/mL-<3.33 ng/mL), high (≥3.33 ng/mL). Corresponding numeric data in Supplemental Material, Table S2.

Figure 3. Surrogate Category Analysis among Males, Analysis 1. The displayed values are the minimum (bottom whisker), 25th percentile (bottom of box), median (line in box), mean (diamond), 75th percentile (top of box), and maximum (top whisker). The horizontal line at 0.8 is a reference line. The x axis represents the number of repeated samples. Tertiles were defined as follows: low (<2.20 ng/mL), medium (≥2.20 ng/mL-<4.15 ng/mL), high (≥4.15 ng/mL). Corresponding numeric data in Supplemental Material, Table S3.

Figure 4. Surrogate Category Analysis among Males, Analysis 2. The displayed values are the minimum (bottom whisker), 25th percentile (bottom of box), median (line in box), mean (diamond), 75th percentile (top of box), and maximum (top whisker). The horizontal line at 0.8 is a reference line. The x axis represents the number of repeated samples. Tertiles were defined as follows: low (<2.20 ng/mL), medium (≥2.20 ng/mL-<4.15 ng/mL), high (≥4.15 ng/mL). Corresponding numeric data in Supplemental Material, Table S4.

Figure 1.

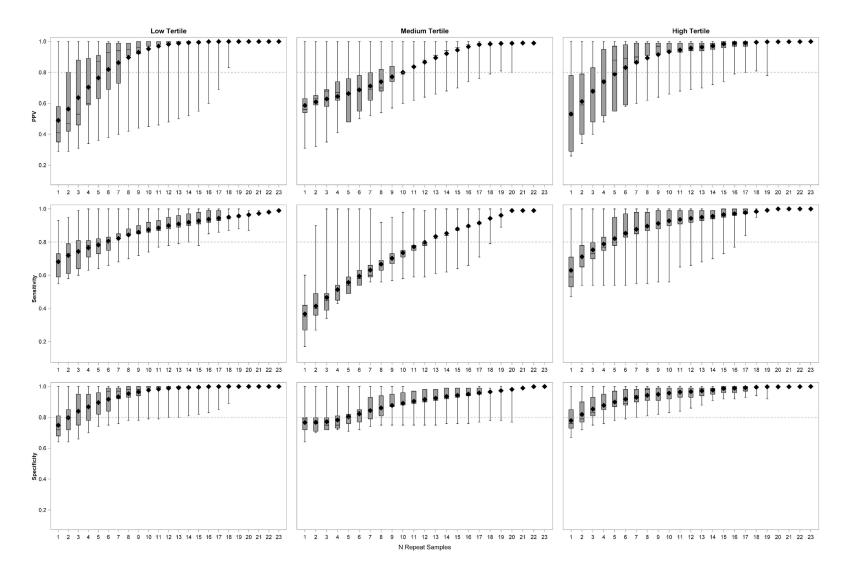


Figure 2.

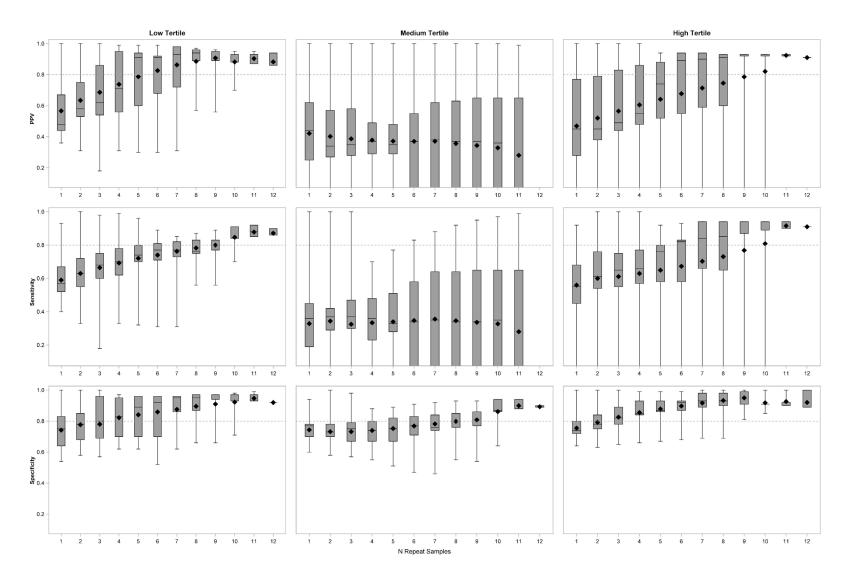


Figure 3.

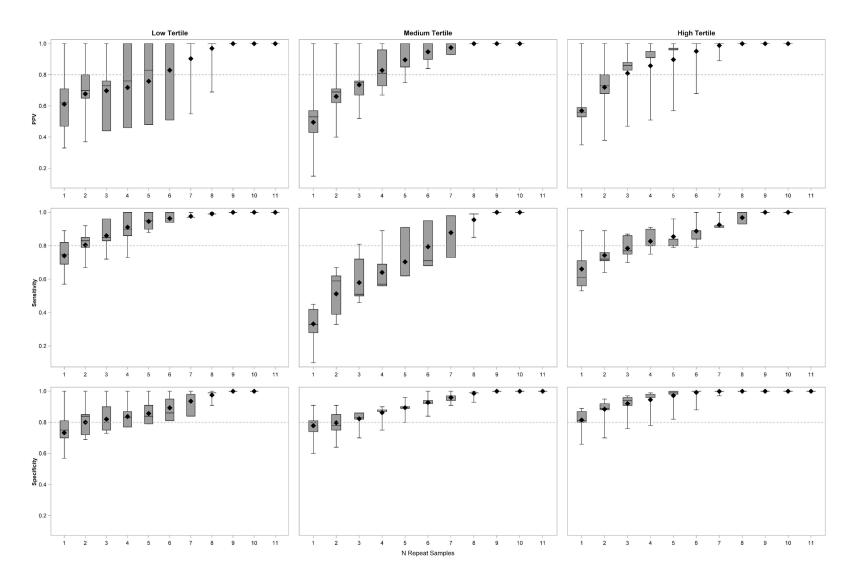


Figure 4.

